# Efficient Algorithms for Weighted Rank-Maximal Matchings and Related Problems

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### **Outline of The Presentation**

#### Outline

Rank-Maximal Matchings

Weighted Matchings

Algorithm

Popular Matchings

Faster Algorithm

- Rank-Maximal Matchings
- Weighted Rank-Maximal Matchings
- Reducing Weighted Rank-Maximal Matchings to Rank-Maximal Matchings
  - Popular Matchings



Rank-Maximal Matchings

Notation

The Problem

Signature

Weighted Matchings

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### **Rank-Maximal Matchings**

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- Rank-Maximal Matchings
- Notation
- The Problem
- Signature
- Weighted Matchings
- Algorithm
- Popular Matchings
- Faster Algorithm

- Let  $\mathcal{A}$  be a set of applicants and  $\mathcal{P}$  be a set of posts.
- We put an edge between an applicant a and a post p if a has a preference for post p.
- Moreover, if a has a high preference for p, we put a higher rank (lower number) for the corresponding edge.



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### **Rank-Maximal Matchings**

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Maximum no. of applicants are assigned their favourite posts in a rank-maximal matching.



A Rank–Maximal Matching

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### **Rank-Maximal Matchings**

- Rank-Maximal
- Matchings
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- Weighted Matchings
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- The signature of a matching where applicants have upto r ranks is  $(x_1, x_2, \dots, x_r)$ , where  $x_i$  is the no. of applicants assigned their *i*-th choice post.
- We want to maximize the signature lexicographically in a rank-maximal matching.



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Rank-Maximal Matchings

#### Weighted Matchings

The Problem Reducing the Problem

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## Weighted Rank-Maximal Matchings

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### Weighted Rank-Maximal Matchings

Outline

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- Weighted Matchings

The Problem

Reducing the Problem

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- Suppose we assign weights to each applicant.
- In the signature  $(x_1, x_2, \dots, x_r)$ ,  $x_i$  is now the sum of weights of applicants assigned their *i*-th choice post.





Rank-Maximal Matchings

- Weighted Matchings The Problem
- Reducing the Problem
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### Reducing Weighted Rank-Maximal Matchings to Rank-Maximal Matchings

Partition the edges  $E_i$  of each rank into k classes:  $E_{i,1}, \dots, E_{i,k}$ , where  $w_1 > w_2 \dots > w_k$  are the weights and  $E_{i,j}$  is the set of edges incident to applicants of weight  $w_j$ . Find a rank-maximal matching in  $(\mathcal{A} \cup \mathcal{P}, E_{1,1} \cup E_{1,2} \dots \cup E_{r,1} \dots \cup E_{r,k}).$ 





Rank-Maximal Matchings

Weighted Matchings The Problem Reducing the Problem

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# Solving the Problem as a Problem of Rank-Maximal Matchings

<u>**Theorem-1**</u>: The problem of finding a weighted rank-maximal matching where there are r ranks and k weights is the same as finding a rank-maximal matching in a graph with  $r \cdot k$  ranks.



Signature: (1,0,1,0,0,1,0,0)



Rank-Maximal Matchings

Weighted Matchings

Algorithm

 $\mathsf{E}\ \mathsf{O}\ \mathsf{and}\ \mathsf{U}$ 

Augmenting M1

Existing Algorithm

Another Approach

Popular Matchings

Faster Algorithm

# **Algorithm for Rank-Maximal Matchings**



Rank-Maximal Matchings

Weighted Matchings

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E O and U

Augmenting M1 Existing Algorithm Another Approach

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Faster Algorithm

- Find a maximum matching  $M_1$  in  $G_1 = (\mathcal{A} \cup \mathcal{P}, E_1)$ .
- Find  $\mathcal{E}_1, \mathcal{O}_1$  and  $\mathcal{U}_1$ , the set of even, odd and unreachable vertices in  $G_1$ .



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### **Augmenting the Matching**

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- Weighted Matchings

Algorithm

 $\mathsf{E}\ \mathsf{O}\ \mathsf{and}\ \mathsf{U}$ 

Augmenting M1

Existing Algorithm Another Approach

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Faster Algorithm

Add all edges incident only to vertices in  $\mathcal{E}_1$  from  $E_2$ . Augment  $M_1$  in this new graph to get a matching  $M_2$ .



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Rank-Maximal Matchings

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 $\mathsf{E}\ \mathsf{O}\ \mathsf{and}\ \mathsf{U}$ 

Augmenting M1

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- Add all edges incident only to vertices in  $\mathcal{E}_1 \cap \cdots \cap \mathcal{E}_i$  from  $E_{i+1}$ .
- Augment  $M_i$  in this new graph to get a matching  $M_{i+1}$ .
  - This approach was used by Irving et al. to give an  $O(r \cdot m \cdot \sqrt{n})$  algorithm for finding rank-maximal matchings.



### **Another Approach for Finding Rank-Maximal** Matchings

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- The best known algorithm for finding a perfect matching in bipartite graphs [Mucha and Sankowski] runs in  $O(n^{\omega})$  randomized time.
- Can we use this algorithm for finding rank-maximal matchings in  $O(r \cdot n^{\omega})$  randomized time?
- Before that we will look at another problem...



Rank-Maximal Matchings

Weighted Matchings

Algorithm

#### Popular Matchings Popularity The Problem f-posts s-posts Popular Matchings Algorithm Popular Matchings Faster Algorithm Running Time

Faster Algorithm

## **Popular Matchings**



### **Popularity of Matchings**

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Popularity

The Problem

f-posts

s-posts

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Faster Algorithm

A matching M' is more popular than M if the number of applicants preferring M' to M exceeds the number of applicants preferring M to M'.



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### **Popular Matchings**

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- Running Time

Faster Algorithm

- A matching M is called a popular matching if there is no matching M' which is more popular than M.
- We introduce an artificial last resort post called l(a) for each a so that from now on we always deal with  $\mathcal{A}$ -complete matchings.





### **Popular Matchings**

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- Rank-Maximal Matchings
- Weighted Matchings
- Algorithm

Popular Matchings Popularity

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- Faster Algorithm

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- We introduce an artificial last resort post called l(a) for each a so that from now on we always deal with  $\mathcal{A}$ -complete matchings.



![](_page_19_Picture_0.jpeg)

### Finding f-posts for each applicant

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s-posts Popular Matchings Algorithm

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In  $G_1 = (\mathcal{A} \cup \mathcal{P}, E_1)$ , find  $\mathcal{E}, \mathcal{O}$  and  $\mathcal{U}$  w.r.t  $M_1$ .

For each applicant a find f(a), the set of a's most preferred posts which belong in  $\mathcal{O} \cup \mathcal{U}$ .

![](_page_19_Figure_14.jpeg)

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![](_page_20_Picture_0.jpeg)

### Finding s-posts for each applicant

Outline

Rank-Maximal Matchings

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f-posts

#### s-posts

Popular Matchings Algorithm Popular Matchings Faster Algorithm Running Time

Faster Algorithm

- s(a) is the set of a's most preferred posts which belong in  $\mathcal{E}$ .
- Such a post always exists since we have introduced l(a).

![](_page_20_Figure_13.jpeg)

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![](_page_21_Picture_0.jpeg)

### **Algorithm for Popular Matchings**

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s-posts

Popular Matchings Algorithm

Popular Matchings Faster Algorithm Running Time

Faster Algorithm

- In G, consider only edges which match an applicant a to f(a) or s(a).
- Start with M<sub>1</sub> and augment it to get a maximum matching.
  This is a popular matching.
- This algorithm by Abraham et al. runs in  $O(m \cdot \sqrt{n})$  time.

![](_page_21_Figure_17.jpeg)

![](_page_22_Picture_0.jpeg)

### **Faster Algorithm for Popular Matchings**

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Faster Algorithm

Modify G' by adding  $|\mathcal{P}| - |\mathcal{A}|$  vertices to  $\mathcal{A}$  and make these new vertices adjacent to all s-posts.

• Find a perfect matching in this graph using the  $O(n^{\omega})$  algorithm by Mucha and Sankowski.

![](_page_22_Figure_17.jpeg)

![](_page_23_Picture_0.jpeg)

### **Faster Algorithm for Popular Matchings**

Outline

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Faster Algorithm

Modify G' by adding  $|\mathcal{P}| - |\mathcal{A}|$  vertices to  $\mathcal{A}$  and make these new vertices adjacent to all s-posts.

• Find a perfect matching in this graph using the  $O(n^{\omega})$  algorithm by Mucha and Sankowski.

![](_page_23_Figure_12.jpeg)

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![](_page_24_Picture_0.jpeg)

### **Completing the Algorithm and Finding its Running Time**

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Rank-Maximal Matchings

Weighted Matchings

Algorithm

Popular Matchings Popularity

The Problem

f-posts

s-posts

Popular Matchings

Algorithm

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Faster Algorithm

- Remove the extra vertices added and edges incident upon them to get an applicant perfect matching.
- This new algorithm runs in  $O(n^{\omega})$  randomized time.

![](_page_24_Figure_17.jpeg)

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![](_page_25_Picture_0.jpeg)

Rank-Maximal Matchings

Weighted Matchings

Algorithm

Popular Matchings

Faster Algorithm

Find E1 O1 and U1 Find E2 O2 and U2 Adding Vertices Perfect Matching Conclusion

# Faster Algorithm for Rank-Maximal Matchings

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![](_page_26_Picture_0.jpeg)

### Find Even, Odd and Unreachable Vertices

Outline

Rank-Maximal Matchings

Weighted Matchings

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Popular Matchings

Faster Algorithm Find E1 O1 and U1

Find E2 O2 and U2 Adding Vertices Perfect Matching Conclusion

![](_page_26_Figure_9.jpeg)

![](_page_26_Figure_10.jpeg)

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![](_page_27_Picture_0.jpeg)

Rank-Maximal Matchings

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Popular Matchings

Faster Algorithm Find E1 O1 and U1 Find E2 O2 and U2

Adding Vertices Perfect Matching Conclusion Add all edges incident only to vertices in  $\mathcal{E}_1$  from  $E_2$  to get  $G_2$ .

• Find  $\mathcal{E}_2, \mathcal{O}_2$  and  $\mathcal{U}_2$  in  $G_2$ .

![](_page_27_Figure_11.jpeg)

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![](_page_28_Picture_0.jpeg)

### **Adding New Vertices and Edges**

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Rank-Maximal Matchings

Weighted Matchings

Algorithm

Popular Matchings

Faster Algorithm Find E1 O1 and U1 Find E2 O2 and U2

Adding Vertices

Perfect Matching Conclusion

- Add all edges incident only to vertices in  $\mathcal{E}_1 \cap \mathcal{E}_2$  from  $E_3$  to get  $G_3$ .
- Add  $|\mathcal{A}| |M_2|$  vertices to  $\mathcal{P}$  and make these adjacent to all vertices in  $\mathcal{E}_1 \cap \mathcal{E}_2 \cap \mathcal{A}$ .
- Add  $|\mathcal{P}| |M_2|$  vertices to  $\mathcal{A}$  and make these adjacent to all vertices in  $\mathcal{E}_1 \cap \mathcal{E}_2 \cap \mathcal{P}$ .

![](_page_28_Figure_13.jpeg)

![](_page_29_Picture_0.jpeg)

### Finding a Perfect Matching and Removing Vertices

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Rank-Maximal Matchings

Weighted Matchings

Algorithm

Popular Matchings

Faster Algorithm Find E1 O1 and U1 Find E2 O2 and U2 Adding Vertices Perfect Matching

Conclusion

- Find a perfect matching in this graph using the  $O(n^{\omega})$  algorithm by Mucha and Sankowski.
- Remove the newly added vertices and the edges incident upon them to get a rank-maximal matching.

![](_page_29_Figure_11.jpeg)

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![](_page_30_Picture_0.jpeg)

Rank-Maximal Matchings

Weighted Matchings

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Popular Matchings

Faster Algorithm Find E1 O1 and U1 Find E2 O2 and U2 Adding Vertices Perfect Matching

Conclusion

- Find a perfect matching in this graph using the  $O(n^{\omega})$  algorithm by Mucha and Sankowski.
- Remove the newly added vertices and the edges incident upon them to get a rank-maximal matching.

![](_page_30_Figure_11.jpeg)

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![](_page_31_Picture_0.jpeg)

### Conclusion

Outline

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Faster Algorithm Find E1 O1 and U1 Find E2 O2 and U2 Adding Vertices Perfect Matching Conclusion

- <u>**Theorem-2</u>**: The Rank-Maximal matching problem can be solved in  $O(r \cdot n^{\omega})$  randomized time.</u>
- The Weighted Rank-Maximal matching problem can be solved in  $O(r \cdot k \cdot n^{\omega})$  randomized time.